

Supporting Information for (34 pp):

Shallow Gas Migration along Hydrocarbon Wells – An Unconsidered, Anthropogenic Source of Biogenic Methane in the North Sea

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Content

| | |
|-----------|---|
| Figure S1 | Gas leakage and gas flow measurements along three abandoned gas wells investigated by Vielstädte et al. ²⁰ . |
| Figure S2 | Geochemical results of free seep gases and porewaters at the three investigated wells ²⁰ . |
| Figure S3 | Dissolved CH ₄ concentrations in the water column at well 15/9-13. |
| Figure S4 | Total organic carbon (TOC) and dissolved sulfate (SO ₄) concentrations in the sediment. |
| Figure S5 | Numerical results of the bubble dissolution model. |
| Figure S6 | Bathymetric map of the North Sea and the surface location of the 11 122 wells. |
| Table S1 | Quantification of seabed gas releases along three abandoned wells in the Central North Sea (compiled data based on Vielstädte et al. ²⁰). |

| | |
|----------|--|
| Table S2 | Parameterization of numerical model. |
| Table S3 | Source data of the North Sea well inventory. |
| Table S4 | Classification of wells in the North Sea (as of 2012-2013). |
| Table S5 | Recalculate the CH ₄ budget of the North Sea: Sources and sinks for CH ₄ in the North Sea. |

1. Definitions and nomenclature

Leakage: In this paper leakage is defined as “fugitive”, or unintended emission of shallow gas. It is sourced from gas accumulations in the overburden of the deep hydrocarbon reservoir (i.e. in the upper 1000 m of sediment), through which the well has been drilled. To the best of our knowledge, leakage of shallow gas can be induced by any type of well (production, injection, dry, or abandoned).

Well integrity: There is no common global definition of well integrity, but the NORSOK D-010³ definition is widely used for the North Sea. It defines well integrity as an application of technical, operational and organizational solution to reduce the risk of uncontrolled release of formation fluids throughout the life cycle of the well. Based on this definition, operators and governmental agencies perform well integrity surveys, targeting the leakage of formation fluids through the cement, casing and completion equipment, having a focus mostly on active wells, as monitoring is not mandatory after well abandonment³.

Well: According to the Norwegian Petroleum Directorate (NPD) guidelines for designation of wells and wellbores⁴⁵, a well is defined as a borehole which is drilled in order to discover or delimit a petroleum deposit and/ or to produce petroleum or water for injection purposes, to inject gas, water or other media, or to map or monitor well parameters⁴⁵. A well may consist of one or several wellbores (well paths) and may have one or several termination points⁴⁵.

Wellbore (well path): A wellbore/well-path designates the location of the well from one termination point to the wellhead and may consist of one or more well tracks⁴⁵.

Well track: The well track is the part of a wellbore (well path) which extends from a point of drilling out on the existing wellbore (kick-off point) to a new termination point for the well⁴⁵.

Multilateral wells: Multilateral wells have more than one wellbore radiating from the main wellbore⁴⁵. In contrast to sidetracked wells, where the first bottom section is plugged back before a sidetrack is drilled, multilateral wellbores have more than one wellbore open at the same time⁴⁵.

Active wells: Operating-/active wells are defined as production or injection wells that are currently producing or injecting⁴⁵.

Abandoned wells: Inactive wells may be temporarily or permanently abandoned. According to the regulations of the NORSOK D-010 standard³, temporarily abandoned wells are defined as all wells/ wellbores except all active wells and wells that are permanently plugged and abandoned (P&A). Temporarily abandoned wells can be sealed with a mechanical plug, whereas permanently plugged and abandoned wells, whose casings and wellhead need to be cut-off at least 5 mbsf, are sealed with cement³.

2. Supporting Material and Methods

2.1 Geochemical and seismic data analysis of CH₄ leakage at three abandoned gas wells in the Central North Sea

The following section provides a summary of relevant geochemical and seismic analysis of three leaky abandoned wells (15/9-13, 16/4-2, and 16/7-2) located in water depths of 81-93 m in the Norwegian CNS (Figure 2), earlier published by Vielstädte et al.²⁰. The authors²⁰ characterized the origin of the emanating gases (2.1.1), leakage rates (2.1.2), and initial gas bubble size distribution (2.1.) providing a baseline for the extrapolation analysis presented in this study. Sections 2.1.4 and 2.1.5 include new geochemical data on CH₄ oxidation rates in the water column observed at wells 15/9-13 and 16/7-2 and total organic carbon (TOC) and sulfate (SO₄) concentrations in near surface sediments at a reference site in the CNS, respectively.

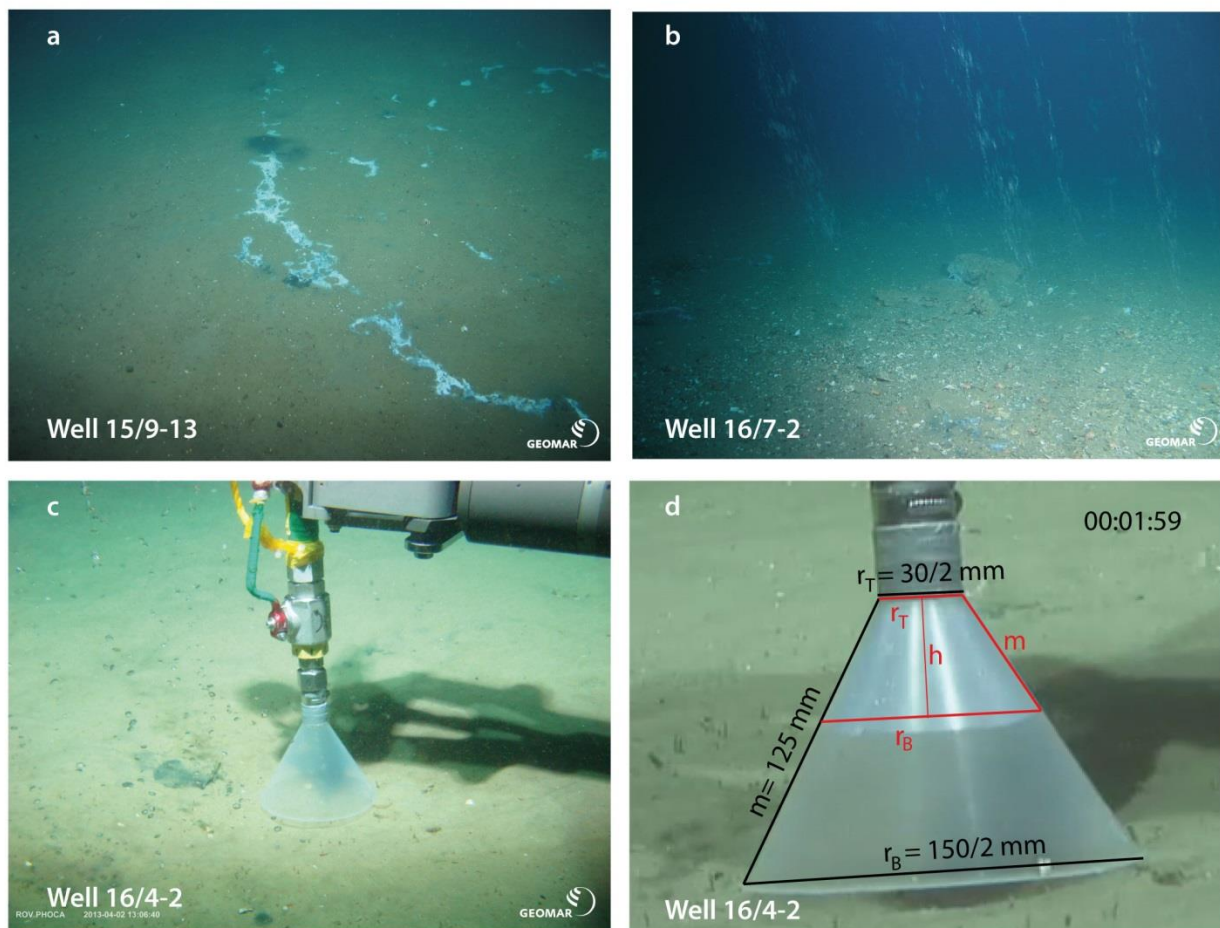


Figure S1| Gas leakage and gas flow measurements at the three wells investigated in Reference²⁰ (note that plugging and abandonment regulations in the North Sea require the cut-off of wellheads at least 5 m below the seafloor, so that these wells “disappear”). Pictures showing **a)** bacterial mats related to CH_4 leakage at well 15/9-13, **b)** the most intense leakage at well 16/7-2, **c)** gas flow measurement at well 16/4-2, and **d)** exemplary visualization of optically derived gas flow measurement at well 16/4-2 using the funnel attached to the gas sampler. Dimensions of the funnel are: m = lateral funnel height, r_T = radius of the top plane, and r_B = radius of the bottom plane. The gas volume was determined by measuring the corresponding dimensions of the gas filled frustum of a cone and calculating the height, h (red letters) as described in Reference²⁰.

2.1.1 Determining the origin of leaking gases. The origin of the leaking gases was analyzed by Vielstädte et al.²⁰ combining geochemical and seismic investigations at the three leaky abandoned

wells (15/9-13, 16/4-2, and 16/7-2) in the Norwegian Sector of the CNS (Figure 2). Full methodological detail on the geochemical analysis of free seep gases and porewaters at the three investigated wells is given in Reference²⁰. Figure S2 shows the results.

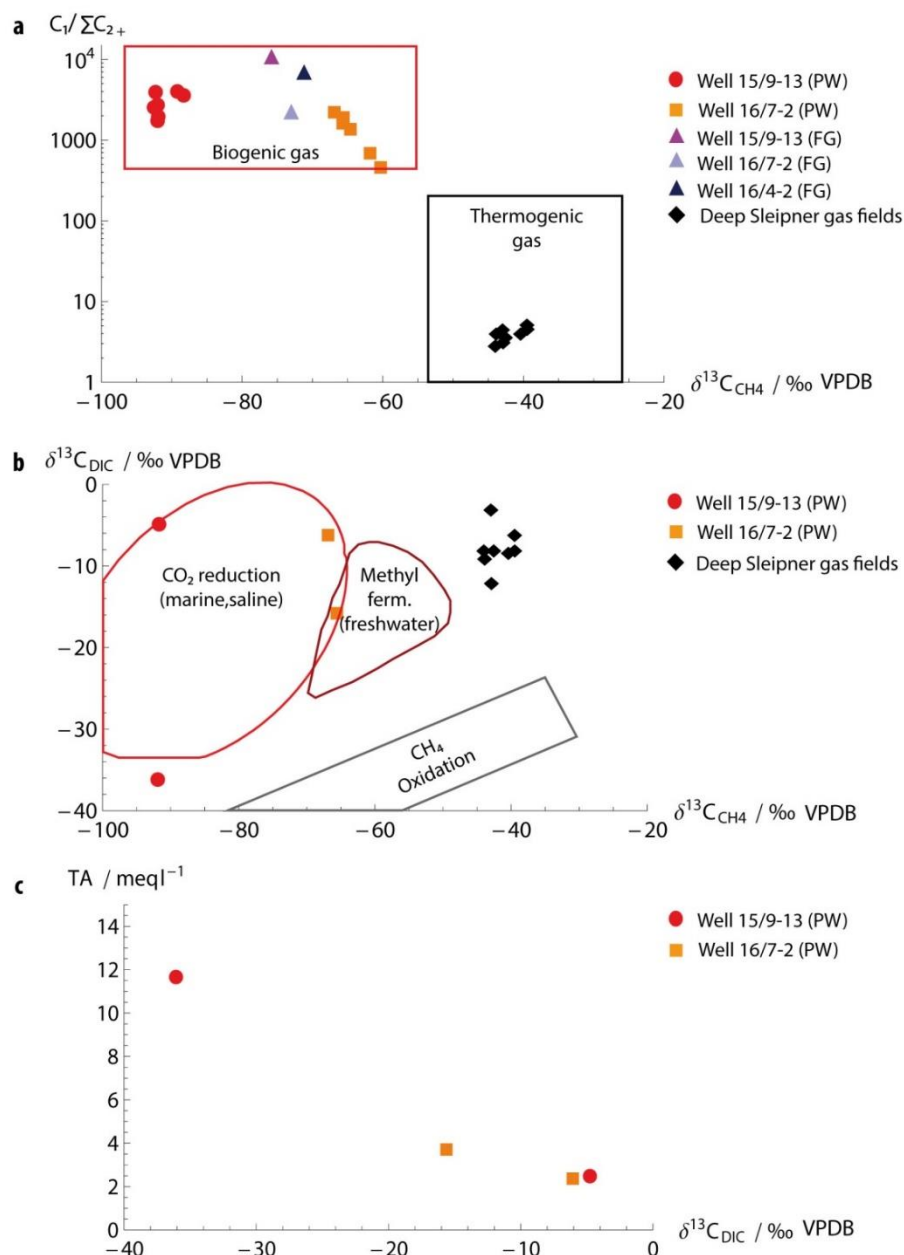


Figure S2| Results of geochemical analysis of free seep gases and porewaters at the three investigated wells (as published by Vielstädte et al.²⁰). (a) Bernard diagram of the molecular and

isotopic gas composition (after Bernard et al.⁴⁸) indicating the gas source of the gas at the abandoned wells (red dots: porewater (PW) at well 15/9-13, orange rectangle: porewater at well 16/7-2, triangles: free seep gas (FG) at wells 15/9-13, 16/7-2, and 16/4-2) and the deep hydrocarbon reservoirs in the area (black diamonds⁴⁹). **(b)** Cross-plot of $\delta^{13}\text{C}$ of DIC versus $\delta^{13}\text{C}$ of CH_4 in the porewater at well 16/7-2 (orange rectangles), well 15/9-13 (red dots), and the deep hydrocarbon reservoirs (black diamonds)⁴⁹. **(c)** Cross-plot of total alkalinity (TA) and $\delta^{13}\text{C}$ of DIC indicating microbial anaerobic oxidation of CH_4 .

In addition to geochemical analysis, Vielstädt et al.²⁰ analyzed industrial 3-D seismic data (ST98M3, Statoil ASA) for shallow gas pockets in the area around the three wells by mapping high amplitude anomalies²² in the upper 1000 m of sediment using Petrel (Schlumberger). The locations of identified gas pockets were assigned to stratigraphic units²⁴ and correlated with the well-paths of the three leaky wells. The authors²⁰ found that two of the wells (i.e. 15/9-13 and 16/7-2) have been drilled through shallow gas in Lower Pliocene (LP) and Top Pliocene (TP) stratigraphic units (Figure 2 b). For well 16/4-2, the seismic data did not reveal prominent bright spots (i.e. reverse polarity high amplitude anomalies) in the direct vicinity of the well-path, indicating that leakage at well 16/4-2 draws gas from larger distances (spatial resolution of the seismic data is ~10 m). Additionally, seismic turbidity in near-surface sediments (Figure 2 b, 0.1 – 0.4 s two-way-travel time TWT) might indicate an unfocussed distribution of gas⁵⁰.

2.1.2 Quantifying per-well leakage rates. The *in-situ* gas flow was quantified at single bubble streams (here referred to as seeps) of wells 16/4-2 and 15/9-13 using the ROV-operated gas sampler with attached funnel (Figure S1 c,d) as described in Reference²⁰. At well 16/7-2, the *in-situ* gas flow was derived from bubble size measurements²⁰. Each flow measurement lasted about 10 minutes, thus temporal variations in the gas flux on time-scales longer than that remain unknown. Longer time-series will be necessary to better constrain our annual emission estimates. Table S1 comprises data of gas flow measurements at the three wells investigated by Vielstädt et al.²⁰.

Here, the gas flow measurements at wells 15/9-13 and 16/4-2²⁰ were used for the assessment of the North Sea-wide release assignment. We only considered the two lower gas flows measured at wells 15/9-13 and 16/4-2²⁰ because they are believed to be more typical for shallow gas migration than the larger gas flow measured at well 16/7-2, which has been drilled through a seismic chimney²⁰.

Table S1| Quantification of seabed gas releases along three abandoned wells in the Central North Sea (compiled data based on Vielstädte et al.²⁰; a seep here refers to as a single bubble stream).

| Well (Water-depth) | Q _{SF} (<i>in-situ</i>) / L min ⁻¹ seep ⁻¹ of CH ₄ | Q _{SF} (STP) / L min ⁻¹ seep ⁻¹ of CH ₄ | No. of seeps | Q _{SF} ^a / t yr ⁻¹ well ⁻¹ of CH ₄ |
|--------------------|--|---|--------------|---|
| 15/9-13 (81 mbsl) | 0.09 | 0.9 ^f | 2 | 1 |
| 16/4-2 (93 mbsl) | 0.15 /0.17 ^b | 1.6/1.8 ^{b,d} | 8 | 4 |
| 16/7-2 (83 mbsl) | 0.15 ^c | 1.4 ^c | 39 | 19 |

^a based on the average gas flow of 1.4 L min⁻¹ seep⁻¹ at STP (35 PSU, 25°C, 1 bar)

^b based on replicate gas flux measurements at well 16/4-2

^c derived from bubble size, due to lack of direct funnel measurements

^d measured at high tide

^e measured at low tide

^f measured 2 h after low tide

2.1.3 Measuring initial bubble sizes. Vielstädte et al.²⁰ analyzed initial bubble size spectra at the three wells from ROV-video sequences applying the image editing software ImageJ⁵¹. For each bubble, the major and minor axes, angle, perimeter, area, circularity, as well as frame number were recorded. The corresponding bubble volume, $V_0 = 4/3\pi \times r_e^3$, was calculated from the equivalent spherical radius, $r_e = (a^2b)^{1/3}$ based on the major, a , and the minor half axes, b , of the fitted ellipse as described in Reference²⁰.

Determined bubble sizes at wells 15/9-13 and 16/4-2 were combined into a common bubble size distribution (ψ)²⁰ (Figure S5). Given that the gas flow at individual seeps of the wells was low such that initial bubble formation processes are primarily controlled by the mechanical properties of the surface sediments³⁸, ψ is proposed to be representative for bubbles released from the fine to medium-grained clayey sand found at the investigated wells and in wide areas of the North Sea²⁶. The combined bubble size distribution (ψ)²⁰ was thus, used for further extrapolation of CH₄ leakage to the North Sea scale by calculating the fate of leaking CH₄ from the seafloor to the atmosphere using a numerical bubble dissolution model (SI Section 2.2.2).

Measurements at well 16/7-2 were excluded for the determination of the combined bubble size distribution because bubbles escaped from below a carbonate rock, thereby expelling significantly larger bubbles into the water column than bubbles directly released from the sandy sediments (i.e. at well 15/9-13 and 16/4-2, for details see Reference²⁰).

2.1.4 Quantifying dissolved CH₄ and CH₄ oxidation (MOx) rates in the water column.

During cruise CE12010 (July-August 2012), seawater samples were taken with Niskin bottles attached to a video-guided CTD or operated by ROV Kiel 6000⁵³. At wells 15/9-13 and 16/7-2 seawater was sampled near the seafloor and additionally through the water column at well 15/9-13. No water samples were recovered at well 16/4-2. For dissolved gas analysis, subsamples were transferred bubble-free into 100 ml headspace vials immediately after recovery of the Niskin Water Sampler Rosette. Dissolved gases were released from the seawater samples by headspace technique (headspace of 10 ml of Ar 4.5). After adding 50µl of saturated HgCl₂-solution the vials were stored at 4°C. Concentration determination of CH₄ released into the headspace was conducted by using onboard gas chromatography (Shimadzu 2010, for results see Table 1 and Figure S3).

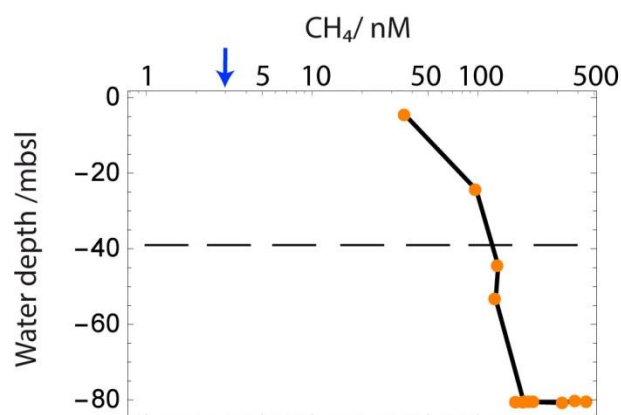


Figure S3| Dissolved CH₄ concentrations in the water column. Depth profile showing the concentration of dissolved CH₄ in the water column (orange bullets) based on measurements during CE12010 31-CTD7 at well 15/9-13. The dashed line indicates the depth of the thermocline and the blue arrow represents the equilibrium concentration of CH₄ in the surface mixed layer (i.e. 3 nM³⁰) with respect to the atmospheric partial pressure of CH₄.

To assess CH₄ oxidation rates (r_{MOx}) in the water column, subsamples were transferred bubble-free into ~23 ml headspace vials and closed with grey bromo-butyl stoppers (Helvoet Pharma, Belgium), immediately after recovery of the Niskin bottles. Shortly after sampling, a 6 μl gas bubble of ¹⁴C-CH₄:N₂ gas (0.25 kBq) was added to the subsamples, which were then incubated for 2 days in the dark at *in-situ* temperature (~8°C). After 2 days, samples were fixed in 4 pellets of NaOH and stored at 4°C until rate measurements were performed in the home laboratory. Radioactive substrate and product pools were quantified as described by Blees and colleagues⁵⁴⁻⁵⁵ to determine the rate constant. Assuming sufficient oxygen supply during incubation, CH₄ oxidation rates were then calculated according to:

$$r_{\text{MOx}} = k \times [\text{CH}_4] \quad \text{Supplement Eq. (1)}$$

where k is the first-order rate constant and $[\text{CH}_4]$ denotes the concentration of CH₄ in seawater (for results see Table 1). All rates were determined in quadruplicates. Killed controls (addition of 200 μl saturated HgCl₂ at the start of the incubation) were analyzed for each incubation period. Recovery of the radioactive tracer was >95%. The detection limit of the rate depends on the amount of radioactive CH₄ added and the initial CH₄ concentration and varied between 0.01 and 6.45 nM day⁻¹ depending on the sample. Above well 15/9-13, all rates were below detection limit. Above well 16/7-2, one out of three sampling locations showed rates below detection limit. For the other two locations above well 16/7-2, rates were 0.19 ± 0.07 and 1.40 ± 0.83 nM day⁻¹ (SEM, N=4).

For comparison, maximal MOx rates measured at well 16/7-2 were generally one order of magnitude lower than those observed at other highly active natural marine seep sites (e.g. at hydrothermal vents at the Juan de Fuca Ridge⁵⁶, cold seeps in the Santa Barbara Channel⁵⁷ at Hydrate Ridge⁵⁸ and the Svalbard continental margin³⁹), and 2-3 orders of magnitude lower than at other, more catastrophic anthropogenic methane release sites (e.g. the Deep Water Horizon oil spill where MOx rates were $\leq 5900 \text{ nM d}^{-1}$ ⁵⁹ and the North Sea Blowout well 22/4b where MOx rates were $\leq 498 \text{ nM d}^{-1}$ ⁴⁰). Even though CH₄ concentrations were high throughout the water column (i.e. 36-1014 nM at well 15/9-13) and there was no limitation in O₂, the low activity of microbial CH₄ oxidation at the investigated wells may be due to changes in the abundance of CH₄ oxidizing bacteria (MOB) caused by water mass exchange. Steinle et al.³⁹ found that lateral transport of water column MOB away from the CH₄ point source reduced water column MOx activity at seeps offshore Svalbard. A similar impact of lateral transport was found at the Blowout well 22/4b in the British Sector of the North Sea, where MOx rates were significantly higher within the seabed crater which was partly shielded against tidal influences and currents⁴⁰.

2.1.5 Quantifying total organic carbon (TOC) and dissolved sulfate (SO₄) concentrations in surface sediments and associated pore fluids. In summer 2012, surface sediment samples were retrieved in the CNS using the Geo-Corer 6000 vibro corer (VC) system provided by the Geological Survey of Ireland⁵³. VC sediment cores were cut in half and ~3 cm thick slices were taken in approximately 20-40 cm intervals. Subsequently, the porewater was extracted at ambient room temperature (~19°C) using a low pressure-squeezer (argon at 3-5 bar, sometimes up to 7 bar). While squeezing, the porewater was filtered through 0.45 µm regenerated cellulose Whatman filters and collected in recipient vessels. Concentration determination of SO₄ in pore fluids and TOC in the sediment was conducted from subsamples using shore-based ion chromatography (METROHM 761 Compact IC-System) and the CARLO ERBA Elemental Analyzer (NA 1500, operating at 1050°C), respectively. TOC measurements in the sediment were made in ~10 cm intervals using freeze-dried and grinded subsamples that were weighed into silver cups and acidified with 0.25N hydrochloric acid to remove carbonate carbon, prior to combustion.

The low TOC concentrations in surface sediments (~0.1 wt %) and high dissolved SO_4 concentrations in associated pore fluids (29 mM) document the low potential for biogenic gas formation in CNS surface sediments (see Figure S4). These geochemical observations confirm that the biogenic gas emitted at the wells does not originate from microbial gas production in ambient surface sediments but from subsurface gas reservoirs.

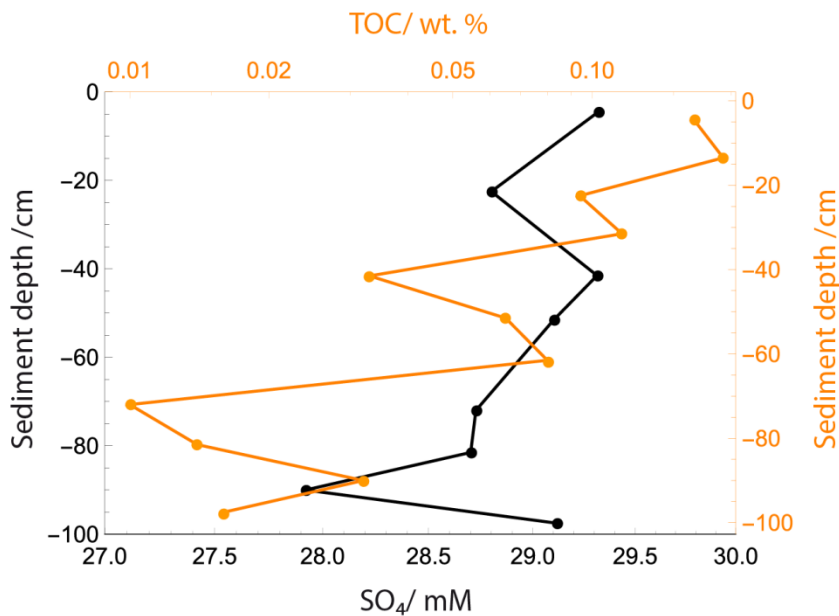


Figure S4| Total organic carbon (TOC) and dissolved sulfate (SO_4) concentrations in the sediment. Depth profile showing the concentrations of TOC (orange bullets) and dissolved SO_4 (black bullets) in the CNS surface sediments based on measurements at a reference station in 88.6 m water depth (CE12010 18-VC7, 58°35.740'N, 02°05.179'E). Similar values were measured in other sediment cores taken during cruise CE12010.

2.2 Extrapolation of drilling-induced CH_4 leakage to the North Sea scale

2.2.1 Seismic mapping of shallow gas and the probability of wells to leak. The examination of the probability of wells to leak shallow gas is based on the analysis of an industrial 3-D seismic data set ST98M3, which is the result of merging seven independently acquired and processed sub-datasets. Detailed information regarding processing parameters of the specific subsets are not available, while the processing sequence for merging the data included resampling, filtering, phase rotation and amplitude adjustments. The final 3-D seismic cube shows positive acoustic

impedance contrasts as positive amplitude (blue) followed by negative amplitude (yellow). The bin-size is 12.5 m and the vertical resolution is ~10 m (dominant frequency 45 Hz, seismic velocity of ~1800 m/s for the upper 400 m and ~2000 m/s below). The dataset extends 62 km from north to south and 46 km from east to west covering an area of more than 2000 km² (Figure 2 a).

Shallow gas pockets in the uppermost 1000 m of sediment, identified by high amplitude anomalies in the seismic data²², were mapped and assigned to stratigraphic units²⁴ using the seismic analysis software Petrel (Schlumberger). Assuming that leakage of shallow gas can potentially occur along any type of well (producing, injecting, abandoned, dry), as long as there is a shallow gas accumulation in its vicinity, an increased permeability induced by the drilling operation, and a driving force for gas movement, which could be buoyancy or excess pore pressure, we correlated the well paths of a total of 55 wells in the seismic study area with locations of shallow gas pockets. 50 sidetracked and multilateral wells were excluded for the correlation analysis because they separate from the main well in the deeper subsurface, which was not the scope of this study. Further, 55 wells, having platforms at the sea surface, were deselected because no 3-D seismic data of the overburden sediments existed. The probability of wells to leak shallow gas was then determined by the fraction of wells which penetrate high amplitude anomalies in the shallow subsurface (i.e. 18 of 55 selected wells, Figure 2) and is required for further extrapolation of CH₄ leakage to the North Sea scale (SI Section 2.2.4).

2.2.2 Modeling the fate of leaking CH₄. An existing numerical bubble dissolution model²⁰ was used to calculate the bubble-mediated CH₄ flow to the atmosphere by a single rising gas bubble. The simulation of a single rising bubble seems to be justified because only single bubble streams were observed at the investigated wells (Figure S1) with very little to no interaction between the bubbles, or plume dynamics (upwelling). Assuming that the release of single bubble streams is representative for leaky wells in the North Sea, the model simulates the shrinking of a gas bubble due to dissolution in the water column, its expansion due to decreasing hydrostatic pressure in the course of its ascent and gas stripping, and the final gas transport to the atmosphere. A set of coupled ordinary differential equations (ODEs) was solved numerically describing these processes for each of the involved gas species (CH₄, N₂, and O₂; Eq. S2) and the bubble rise

velocity (Eq. S3), thus time being the only independent variable. Thermodynamic and transport properties of the gas components, such as molar volume, gas compressibility, and gas solubility in seawater, were calculated from respective equations of state⁶⁰⁻⁶³, and empirical equations for diffusion coefficients⁶⁴, mass transfer coefficients⁶⁵, and bubble rise velocities⁶⁶, taking into account local pressure, temperature and salinity conditions as measured by CTD casts. Implemented equations and values are provided in Table S2. The ODE system is solved using finite difference methods implemented in the NDSolve object of Mathematica (i.e. LSODA)⁶⁷.

The mass exchange of gas components across the bubble surface is generally described as^{66, 68-69}.

$$dN_i / dt = 4\pi r_{eq}^2 K_{L,i} (C_{a,i} - C_{eq,i}) \quad \text{Supplement Eq. (2)}$$

where i is the i^{th} gas species, N , is the amount of gas in the bubble, $4\pi r_{eq}^2$ is the surface area of the equivalent spherical bubble, K_L is the specific mass transfer rate between gas phase and aqueous phase, C_a is the dissolved gas concentration, and C_{eq} is the gas solubility. All of the above variables are functions of the water depth, z , i.e. pressure, temperature and salinity (see Table S2 for details and references). The change of the vertical bubble position is related to the bubble rise velocity, v_b (Table S2):

$$dz / dt = v_b \quad \text{Supplement Eq. (3)}$$

Model simulations were performed based on boundary conditions obtained in the CNS from Sea-Bird 9 plus CTD data of August 2012 (Table S2) and run for different initial bubble sizes (ranging between 1.0 to 4.0 mm radius, in accordance to radii of the combined bubble size distribution, SI Section 2.1.3), initially containing only CH₄. Simulated water depths ranged between 20 and 150 m in accordance to those important for the CH₄ bubble transport to the surface mixed layer (SML) of the North Sea. Larger water depths were not considered because additional model runs revealed that the combined bubble size distribution completely loses its initial CH₄ content in the deep layer of the North Sea when released from more than 150 m depth, Figure S5.

The CH₄ emissions from leaky wells to the atmosphere were calculated distinguishing between direct emissions via bubble transport and indirect emissions via the diffusive outgassing of CH₄ dissolving in the SML (i.e. the upper 50 m of the North Sea water column)³⁷. The direct bubble

CH₄ transport to the atmosphere was calculated from the remaining/residual amount of CH₄ in the bubble, when it reaches the sea surface, N_S , i.e.

$$N_S(r, z) = N_0(r, z) - \int_{t=0}^{t_{max}} dN(r, z) dt \quad \text{Supplement Eq. (4)}$$

,where N_0 is the initial amount of CH₄ in the bubble and t_{max} is the time required by the gas bubble to travel to the sea surface and is determined numerically by the bubble dissolution model. The amount of CH₄ dissolving in the SML of the North Sea (N_{SML}) was calculated by integrating the rate of CH₄ bubble dissolution over the time which is needed by the bubble to travel through the upper 50 m of the water column (i.e. t_{50} to t_{max} , both determined numerically by the bubble dissolution model):

$$N_{SML}(r, z) = \int_{t_{50}}^{t_{max}} dN(r, z) dt \quad \text{Supplement Eq. (5)}$$

Both, the residual CH₄ and the CH₄ dissolving in the SML depend on the initial bubble size (r) and water depth (z) and were normalized to the corresponding N_0 . The relative amount of CH₄ at the sea surface and in the SML with respect to the initial bubble CH₄ content, i.e. $\Omega_S(r, z) = N_S(r, z) / N_0(r, z)$ and $\Omega_{SML}(r, z) = N_{SML}(r, z) / N_0(r, z)$, are referred to as the transport efficiencies of a single gas bubble to the sea surface and to the SML, respectively.

A transfer function was fitted to numerical results using the non-linear least-squares fit algorithm. The fit describes the CH₄ transport efficiency of a single bubble to the sea surface as a function of the initial bubble size (r) and the leakage depth (z):

$$\Omega_S(r, z) = e^{-\frac{a}{r^b} z} \quad \text{Supplement Eq. (6)}$$

| | Correlation matrix for parameters | | Least squares estimates | Standard deviation |
|---|-----------------------------------|-------|-------------------------|--------------------|
| | a | b | of parameters | (1-σ) |
| a | 1 | -0.97 | -0.156 | 0.007 |
| b | -0.97 | 1 | 1.26 | 0.04 |

The variance, s^2 of the residuals is better than 0.00013 and the linear correlation coefficient of the fit-curve to the numerical data is better than 0.99. The fit function is valid for initial bubble radii ranging between 1 and 4 mm initially containing only CH₄ and for the given physicochemical properties of the water column obtained in the CNS from Sea-Bird 9 plus CTD data of August 2012 (Table S2). By applying Supplementary Eq. 6, the mass transfer of gases other than CH₄, N₂, and O₂, as well as the development of upwelling flows are considered to be negligible for the CH₄ transport to the sea surface.

Because leaky wells expelled a range of initial bubble sizes, the transport efficiencies $\Omega_S(r, z)$ and $\Omega_{SML}(r, z)$ were calculated for each bubble size and weighted by its volumetric contribution, V_0 , to the total emitted gas bubble volume, V_ψ . Integrating this weighted bubble transport efficiencies over the entire bubble size spectrum (ψ) gives the total CH₄ transport efficiency to the SML (Ω_{SML}) and to the sea surface (Ω_S) with respect to the initial CH₄ release at the seafloor, respectively:

$$\Omega_S(\psi, z) = \frac{1}{MI} \int_{r(min)}^{r(max)} \Omega_S(r, z) \frac{V_0(r)}{V_\psi} dr \quad \text{Supplement Eq. (7)}$$

$$\Omega_{SML}(\psi, z) = \frac{1}{MI} \int_{r(min)}^{r(max)} \Omega_{SML}(r, z) \frac{V_0(r)}{V_\psi} dr \quad \text{Supplement Eq. (8)}$$

where, $r(min)$, and $r(max)$ are the minimum and maximum radii of the bubble size spectrum ψ ²⁰, respectively, and MI is the measurement interval between individual bubble sizes (i.e. 0.1 mm). V_0 and V_ψ refer to optical size measurements at individual gas streams of the investigated wells, which were conducted to determine the combined bubble size spectrum²⁰ (Figure S5). Applying Supplementary Eq. 7 and 8, we assume that there is no change in the weighted volumetric contribution of each bubble size to the total emitted bubble volume (i.e. $V_0(r) / V_\psi = const.$), so that the relative distribution of bubble sizes is considered to be constant, although the release frequency of bubbles may change due to a variability of the seabed gas flow. This means that at a constant mass flow (i.e. per-well leakage rate) a decrease in the hydrostatic pressure (i.e. leakage depth) increases the rate of bubble formation but not their size distribution, as generally validated for seeps with a low gas flow³⁸. Transfer functions were fitted to numerical results of Supplementary Equation 7 and 8, respectively using the non-linear least-squares fitting algorithm “NonlinearModelFit” of Mathematica (Figure S5). The fit-curves describe the transport

efficiency of the bubble size distribution to the sea surface (Eq. S9) and to the SML (Eq. S10) with respect to the seabed CH₄ flow and as a function of the leakage depth (z), respectively:

$$\Omega_S(\psi, z) = e^{-a \cdot z} \quad \text{Supplement Eq. (9)}$$

| Parameter | Least squares estimates of parameter | Standard deviation (1-σ) |
|-----------|--------------------------------------|--------------------------|
| a | 0.0435 | 0.0007 |

$$\Omega_{SML}(\psi, z) = \frac{1}{1 + e^{z-50}} a \times z^{0.5} + \frac{1}{1 + e^{50-z}} \times \frac{1}{b + c \times z^{4.6}} \quad \text{Supplement Eq. (10)}$$

| | Correlation matrix for parameters | | | Least squares estimates | Standard deviation |
|---|-----------------------------------|------|------|-------------------------|---------------------|
| | a | b | c | of parameters | (1-σ) |
| a | 1 | 0.3 | -0.2 | 0.127 | 0.003 |
| b | 0.3 | 1 | -0.8 | 0.73 | 0.04 |
| c | -0.2 | -0.8 | 1 | 6.1×10 ⁻⁹ | 4×10 ⁻¹⁰ |

The variance, s^2 , of the fits is 0.0001 and 0.0005 for the transport efficiency to the sea surface and to the SML, respectively. The numerical accuracy of the model, determined from mass balance errors, was overall better than 99.9%. Supplementary Eq. 9 and 10 are required for the North Sea-wide extrapolation of drilling-induced CH₄ emissions from the seafloor into the atmosphere (SI Section 2.2.4).

Table S2 | Parameterization of numerical model.

| Parameterization | Range | Variance | Reference |
|---|-------------------------------|------------------------|------------------------------|
| ^a Diffusion coeff.: $D_i / \text{m}^2 \text{s}^{-1}$ | | | |
| $D_{\text{O}_2}=1.05667 \times 10^{-9}+4.24 \times 10^{-11} \times T$ | T:0-25°C | 1.00×10^{-21} | Boudreau ⁶⁴ |
| $D_{\text{N}_2}=8.73762 \times 10^{-10}+3.92857 \times 10^{-11} \times T$ | T:0-25°C | 2.94×10^{-23} | Boudreau ⁶⁴ |
| $D_{\text{CH}_4}=7.29762 \times 10^{-10}+3.31657 \times 10^{-11} \times T$ | T:0-25°C | 5.70×10^{-24} | Boudreau ⁶⁴ |
| Mass transfer coefficient: $K_{\text{L},i} / \text{m s}^{-1}$ | | | |
| $K_{\text{L}}=0.013(v_b \times 10^2 / (0.45+0.4 r \times 10^2))^{0.5} \times D_i^{0.5}$ | $r \leq 2.5 \text{ mm}$ | | Zheng and Yapa ⁶⁵ |
| $K_{\text{L}}=0.0694 \times D_i^{0.5}$ | $2.5 < r \leq 6.5 \text{ mm}$ | | Zheng and Yapa ⁶⁵ |
| $K_{\text{L}}=0.0694 (2r \times 10^{-2})^{-0.25} \times D_i^{0.5}$ | $r < 6.5 \text{ mm}$ | | Zheng and Yapa ⁶⁵ |
| Fit to CTD data as function of z | | | |
| $T(z)=8+7/(1+e^{0.375(-21.7512+z)})$ | Z: 0-150 m | 3.99×10^{-2} | |
| $S(z)=35.12-0.67/(1+e^{0.4125(-20.1595+z)})$ | Z: 0-150 m | 4.97×10^{-4} | |
| Density of SW: $\varphi_{\text{SW}} / \text{kg m}^{-3}$ | | | |
| $\varphi_{\text{SW}}(z)=1027.7-2.150/(1+e^{0.279(-21.612+z)})$ | Z: 0-150 m | 6.8×10^{-3} | Unesco ⁷⁰ |
| Bubble rise velocity: $v_b / \text{m s}^{-1}$ | | | |
| $v_b=4474 \times r^{1.357}$ | $r < 0.7 \text{ mm}$ | | Wüest et al. ⁶⁶ |
| $v_b=0.23$ | $0.7 \leq r < 5.1 \text{ mm}$ | | Wüest et al. ⁶⁶ |
| $v_b=4.202 \times r^{0.547}$ | $r \geq 5.1 \text{ mm}$ | | Wüest et al. ⁶⁶ |
| Gas solubility: c_i / mM | | | |
| $c_{\text{N}_2}=0.622+0.0721 z$ | Z:0-150 m | 2.5×10^{-3} | Mao and Duan ⁶³ |
| $c_{\text{O}_2}=1.08+0.1428 z$ | Z:0-150 m | 9.8×10^{-3} | Geng and Duan ⁶² |
| $c_{\text{CH}_4}=1.44+0.1671 z$ | Z:0-150 m | 2.4×10^{-2} | Duan and Mao ⁶¹ |

CH₄ molar volume: $MV_{CH_4} / L \text{ mol}^{-1}$

$$MV_{CH_4} = 1 / (0.0418 + 0.0044 z)$$

Z: 0-150 m

$$3.0 \times 10^{-2}$$

Duan et al.⁶⁰

Hydrostatic Pressure: P_{hydro} / bar

$$P_{hydro} = 1.013 + \rho_{sw} \times g \times z$$

^a The parameterization of the diffusion coefficients is based on a seawater salinity of 35 PSU. Pressure effects have been neglected because at the given water depths (<150 m) the resulting error is less than 1%.

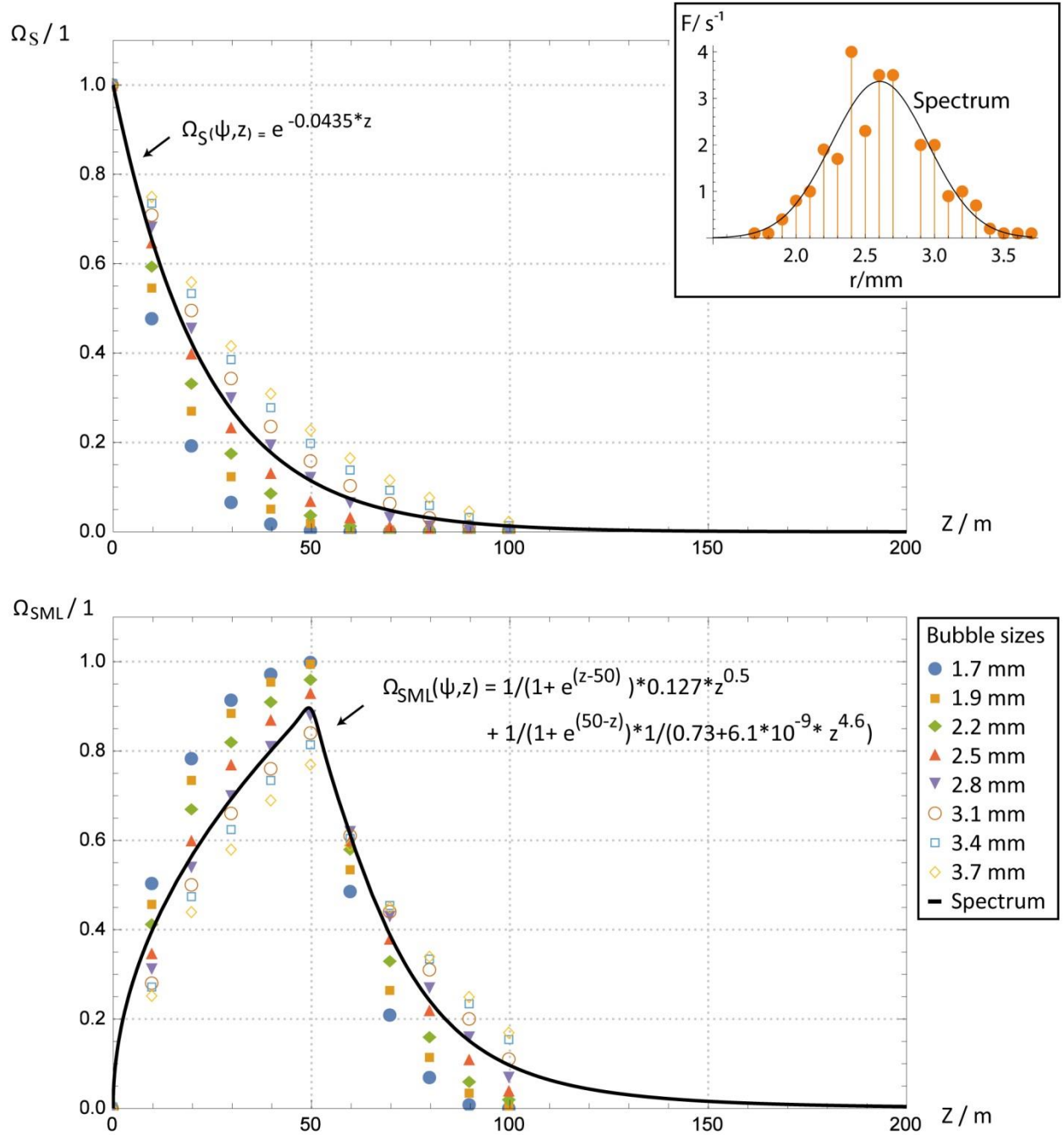


Figure S5| Numerical results of the bubble dissolution model. Model results show the CH₄ bubble transport efficiency to the surface mixed layer (Ω_{SML}) and to the sea surface (Ω_S) of the North Sea, respectively as a function of the leakage depth (z) and for initial bubble radii ranging between 1.7 to 3.7 mm (in accordance to bubble sizes of the combined bubble size distribution measured at the three investigated leaky wells²⁰; upper right corner showing the measured bubble release frequency (F) versus bubble radius (r), and Gaussian fit (black line) for the combined

bubble size spectrum²⁰). The CH₄ transport efficiency of the combined bubble size distribution (black curve) was determined by fit curves to the data using the non-linear least-squares fitting algorithm “NonlinearModelFit” of Mathematica. The variance, s^2 , of the fit-curves is better than 0.001 and 0.005 for $\Omega_S(\psi, z)$ and $\Omega_{SML}(\psi, z)$, respectively.

2.2.3 The well inventory and bathymetry of the North Sea. To extrapolate CH₄ leakage to the North Sea scale, all 15 781 offshore wellbore data (including the well identification, location, status, and type) were incorporated into a database created in ArcGIS (v10.1), sourced from online datasets published by governmental energy departments and regulation agencies in 2012 to 2013 (Table S3, Figure S6). Filters (queries) were applied to categorize and identify the wells for analysis (Table S4). As leakage of shallow gas can potentially occur along any type of well, whether it is producing hydrocarbons, injecting fluid into a reservoir, was dry, or has been abandoned, we selected all types of wells (i.e. 11 122 wells, see Table S4), excluding extra sidetracked and multilateral wells which tend to separate from the main well in the deeper subsurface (i.e. < 1000 m). Sidetracked and multilateral wells were deselected manually from the database following the guidelines for designation of wells and wellbores⁴⁵. In addition, the EMODnet North Sea bathymetry with a spatial resolution of 5 minutes (available at: <http://www.emodnet-bathymetry.eu>; Figure S6) was incorporated into the ArcGIS database. Bathymetric data were required to estimate CH₄ emissions into the atmosphere, which are depth-dependent.

Table S3| Source data of the North Sea well inventory.

| Country | Data Source (Date) | Link |
|----------------|---|---|
| Norway | Norwegian Petroleum Directorate (Sept. 2013) | http://factpages.npd.no/ReportServer?/FactPages/geography/geography_all&rs:Command=Render&rc:Toolbar=false&rc:Parameters=f&IpAddress=1&CultureCode=en |
| United Kingdom | Department of Energy and Climate Change (Aug. 2013) | https://www.gov.uk/oil-and-gas-offshore-maps-and- |

gis-shapefiles

| | | |
|------------|---|---|
| Germany | Niedersächsisches Landesamt für Bergbau, Energie und Geologie (Jul. 2013) | http://nibis.lbeg.de/cardomap3/?TH=BOHRKW |
| Denmark | Danish Energy Agency (Jan. 2012) | http://www.ens.dk/en/oil-gas/oil-gas-related-data/wells |
| Netherland | Netherland Oil and Gas Portal (Jun. 2013) | http://www.nlog.nl/en/activity/activity.html |

Table S4| Classification of wells in the North Sea (as of 2012-2013).

| Well Status | Main Wells/Wellheads | Additional sidetracked & multilateral wells | Total number |
|-----------------------------|----------------------|---|--------------|
| Active ^a | 2818 | 1629 | 4447 |
| Inactive ^b | 7498 | 2637 | 10 135 |
| Shut-in ^c | 5636 | 1696 | 7332 |
| Unknown status ^d | 806 | 393 | 1199 |
| Total | 11 122 ^e | 4659 | 15 781 |

^a including injection, production, and open wells

^b including temporarily and permanently plugged and abandoned wells

^c including only permanently plugged and abandoned/ shut-in wells; excluding wells in the Danish Sector because here no well status was reported in the source data

^d including wells where no well status or type was reported, and Norwegian wells which have been completed to well, or predrilled with no further specification

^e selected for analysis

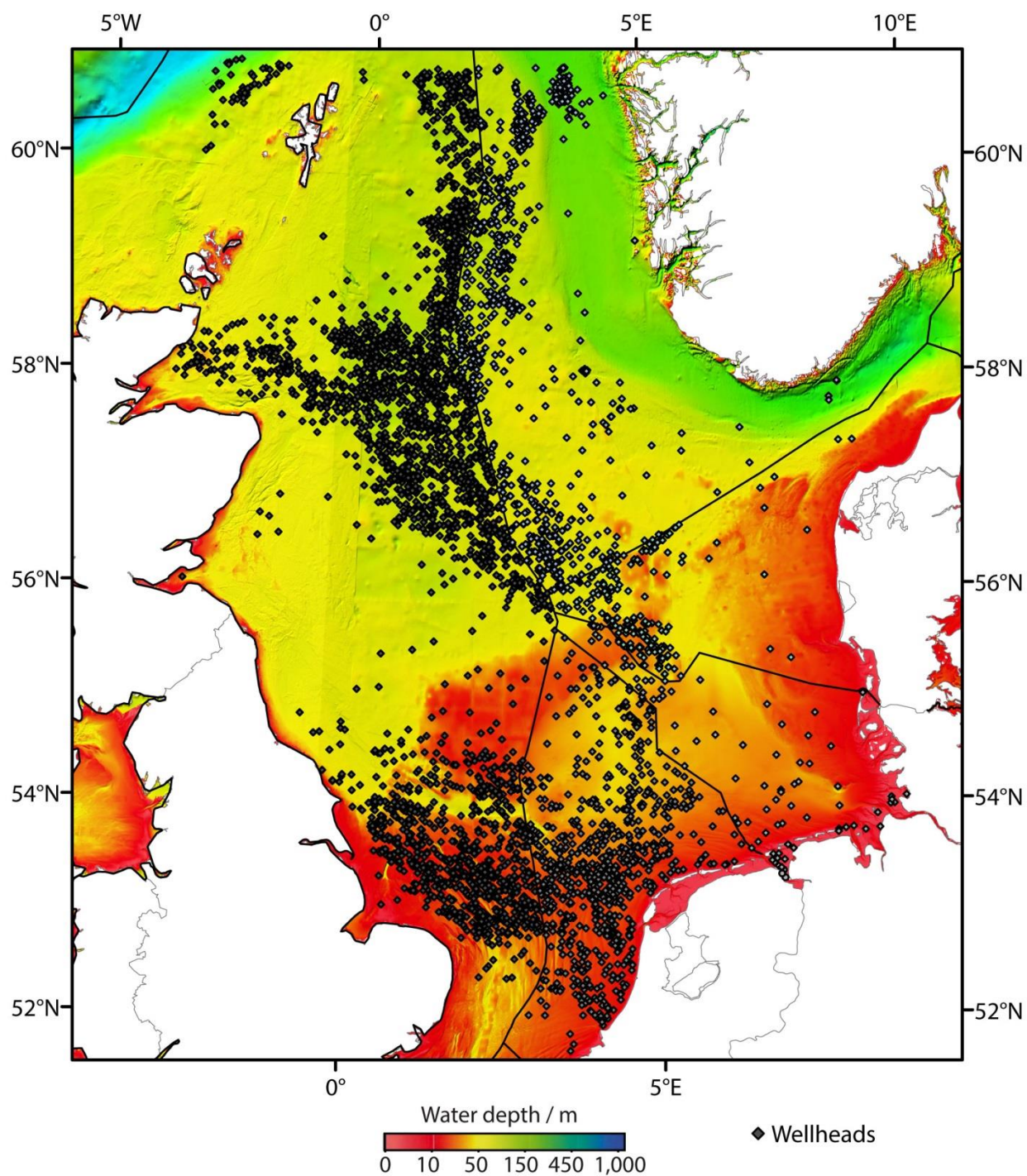


Figure S6| Bathymetric map of the North Sea and the surface location of the 11 122 wells (grayish diamonds). The maps geographic coordinate system refers to WGS84 UTM Zone 31N and is displayed in Mercator Projection.

2.2.4 Extrapolation of drilling-induced CH₄ leakage to the North Sea scale. CH₄ leakage from wells into the North Sea and atmosphere was calculated by extrapolating data obtained in the CNS (leakage rates, initial bubble size distributions, and the likelihood of wells to leak) and results of a numerical bubble dissolution model (SI Section 2.2.2) on the EMODnet North Sea bathymetry and combining publicly available data on drilled wells (SI Section 2.2.3) using the geographical information system software ArcGIS v10.1.

In total, 11 122 active and inactive wells were selected for the North Sea-wide CH₄ release quantification excluding sidetracks of wells (Table S4). The North Sea was subdivided into equal area polygons of 5×5 km² using a Cylindric Equal Area projection and the “Fishnet” tool of ArcGIS v.10.1. Spatial joining of the selected wells and bathymetric data gives each polygon a summary of numeric attributes that fall inside it, i.e. the average water depth (z) and a count field showing how many points fall inside it, i.e. the number of wells.

The seabed CH₄ flow (Q_{SF}) was calculated for each of these polygons multiplying the leakage probability (LP) of $33 \pm 6\%$ for the wells (SI Section 2.2.1), the number of wells located inside each polygon (AF, activity factor), and the potential range of per-well CH₄ leakage rates (LR) of 1-4 t yr⁻¹:

$$Q_{SF} = AF \times LP \times LR \quad \text{Supplement Eq. (11)}$$

For each polygon, the resulting CH₄ flow from the surface water into the atmosphere (Q_{Atm}) was then estimated applying a transfer function describing the CH₄ bubble transport efficiency to the sea surface and to the SML of the North Sea (SI Section 2.2.2, Eq. S9 and S10) as a function of the seabed CH₄ flow (Q_{SF}) and average water depth of the polygon (z):

$$Q_{Atm,i} = Q_{SF,i} \times \Omega_{SML,i/S,i}(\psi.z) \quad \text{Supplement Eq. (12)}$$

, where i is the leakage range (considering either the lower or upper range of possible leakage rates), and ψ is the common bubble size distribution (SI Section 2.1.3). Applying Supplementary Eq. 12, we assume no variation of initial bubble sizes over the extended area of the North Sea (SI Section 2.1.3) and that essentially all of the CH₄ reaching the SML will be transferred into the atmosphere.

All determined flow estimates of individual polygons, were added to calculate the potential range of the total CH₄ ebullition from the seafloor and into the atmosphere. Reported values of CH₄ leakage into the North Sea and the atmosphere are expressed in kilo tonnes of CH₄ per year (kt yr⁻¹ of CH₄), considering the potential range of per-well leakage rates of 1-4 t yr⁻¹ of CH₄ (N = 2)²⁰ and an uncertainty in the leakage frequency of 6% for the wells (N = 55).

2.2.5 Leakage from oil and gas infrastructure in a North Sea CH₄ context. We recalculated the CH₄ budget of the North Sea compiling quantitative literature data on major sources and sinks for marine CH₄ and adding the so-far unrecognized release of shallow gas along leaky wells quantified in this study (for results see Figure 3 and Table S5).

Existing estimates on North Sea-wide CH₄ emissions into the atmosphere are based on the extrapolation of point measurements of CH₄ concentrations in the near-surface seawater and the atmosphere^{27, 30, 36}. The reported diffusive emissions into the atmosphere range from 10-50 kt yr⁻¹ and are believed to already include the diffusive contribution of leaky wells (1-5 kt yr⁻¹), because their CH₄ anomalies are distributed over a broad area of the North Sea (Figure 4) and have thus, likely been detected during the measurement campaigns. In contrast, the blowout well 22/4b constitutes a very local, high flow CH₄ source in the British Sector. It was created in 1990, when Exxon Mobile accidentally drilled into an over-pressurized shallow gas pocket. Its contribution to the atmospheric CH₄ flow was detected in only one³⁰ of the three surveys^{27,30,36}, 3.5 years after the incident occurred. According to the data of Rehder et al.³⁰, well 22/4b contributed 7-12 kt yr⁻¹ to the total atmospheric flux of 50 kt yr⁻¹³⁰. More recent studies suggest that the blowout well releases 2-25 kt yr⁻¹ of CH₄ from the seabed⁴¹⁻⁴², without transporting gas directly into the atmosphere⁷¹. The lack of direct bubble transport suggests that essentially all of the CH₄ released from the seabed dissolves in the water column where it is partly (~1-3%) oxidized by microbes⁴⁰. The remaining CH₄ pool may reach the atmosphere by diffusive outgassing or may be exported to the Atlantic. In summertime, when the water column is stratified, most (~97%) of the CH₄ released at well 22/4b was found to not immediately reach the atmosphere, because it is trapped in the deep layer below the thermocline⁴¹. However, newly released CH₄ and the trapped, non-oxidized CH₄ pool are believed to be transported rapidly to the sea surface and emitted into the atmosphere in wintertime when the water column becomes well mixed as well as during storm events⁴¹. Current annual atmospheric emissions of well 22/4b are thus, believed to be similar to

those quantified by Rehder et al.³⁰ in their earlier conservative study. To incorporate our new data of drilling-induced CH₄ leakage, we recalculated the budget. Total emissions from the North Sea into the atmosphere comprise the range of existing quantifications on the diffusive gas exchange (10-50 kt yr⁻¹ of CH₄) and direct bubble ebullition from leaky wells (0-2 kt yr⁻¹ of CH₄) (Table S5).

The high super-saturation of the North Sea surface waters and the resulting atmospheric degassing of CH₄ constitute the major sink in the marine CH₄ budget (Table S5). Measured CH₄ oxidation rates in the water column were very low (Table 1), such that the microbial sink for CH₄ is expected to be negligible (Table S5). Adding direct bubble ebullition from leaky wells (0-2 kt yr⁻¹ of CH₄) and the amount of CH₄, which is exported to the North Atlantic Ocean (8 kt yr⁻¹)³⁰, the sinks for CH₄ are almost 20-times larger than the known natural sources (rivers, the Wadden Sea, and natural seeps). The North Sea-wide CH₄ input from drilling-induced leakage (leaky wells and blowout well 22/4b), thus likely contributes significantly to the CH₄ budget (see Figure 3 and Table S5). It should be noted that our estimate of CH₄ seepage from natural seeps is based on the few available quantitative measurements that are currently available (Table S5). The numerous natural gas seeps with unknown emission rates that are present in the North Sea may add more CH₄ and contribute significantly to the overall CH₄ input²³.

Table S5 |Sources and sinks for CH₄ in the North Sea. Bold values have been taken to recalculate the CH₄ budget of the North Sea.

| CH₄ Sources | Input/ t yr⁻¹ of CH₄ | Reference |
|-------------------------------|---|---|
| Natural seeps | | |
| Scanner Pockmark Field* | 0.1-13 | Judd and Hovland ³¹ and references therein; Hovland et al. ³⁴ and references therein |
| UK Block 15/25 | 7±? | Judd ³³ and references therein |
| Anvil Point UK | 68±? | Judd ³³ and references therein |

| | | |
|---|--------------------------------|---|
| Torre Bay Firth of Fourth | 1-2 | Judd ³³ and references therein |
| Tommeliten | 26-42 | Schneider von Deimling et al. ³² (lower bound); Judd ³³ (upper bound) |
| Norwegian Block 1/9 Ekofisk** | 52±? | Judd and Hovland ³¹ and references therein; Hovland et al. ³⁴ and references therein |
| Total input via seeps | >0.2×10³ | |
| Rivers | | |
| Rhine | 339 | Upstill-Goddard et al. ²⁷ |
| Weser | 86 | Grunwald et al. ²⁸ |
| Wash | 61 | Upstill-Goddard et al. ²⁷ |
| Elbe | 35 | Rehder et al. ³⁰ ; Grunwald et al. ²⁸ and references therein |
| Humber | 5 | Upstill-Goddard et al. ²⁷ |
| Tyne | 2 | Upstill-Goddard et al. ²⁷ |
| Sheldt | 22-34 | Scranton and McShane ²⁹ |
| Total riverine input | 0.6±? ×10³ | |
| Wadden Sea | | |
| Spiekeroog Island back barrier area | 53 | Grunwald et al. ²⁸ |
| East Frisian back barrier area | 125 | Grunwald et al. ²⁸ |
| Entire back barrier tidal flats*** | 1.0-2.1 ×10³ | Based on Grunwald et al. ²⁸ and references therein |
| Hydrocarbon infrastructure | | |
| Blowout well 22/4b | 2-25 ×10 ³ | Sommer et al. ⁴¹ (lower bound); Leifer ⁴² (upper bound) |

| Shallow gas migration | $3-17 \times 10^3$ | This study |
|---|--|--|
| Total HC infrastructure | $5-43 \times 10^3$ | |
| CH₄ sinks | Loss/ t yr⁻¹ of CH₄ | Reference |
| Atmosphere | | |
| Diffusive gas exchange (excl. 22/4b) | $10-34 \times 10^3$ | Bange et al. ³⁶ and Upstill-Goddard et al. ²⁷ (lower bound); Rehder et al. ³⁰ (upper bound) |
| Diffusive gas exchange (incl. 22/4b) | $30-50 \times 10^3$ | Rehder et al. ³⁰ |
| Diffusive contribution from shallow gas migration along wells | $1-5 \times 10^3$ | This study (Range considering a per-well leakage rates of 1-4 t yr ⁻¹ of CH ₄ and an uncertainty in the leakage frequency of 6%) |
| Direct ebullition from shallow gas migration along wells | $0-2 \times 10^3$ | This study (Range considering a per-well leakage rates of 1-4 t yr ⁻¹ of CH ₄ and an uncertainty in the leakage frequency of 6%) |
| Total losses into the atmosphere | $10-52 \times 10^3$ | This study (diffusive gas exchange and direct ebullition) |
| Microbial CH₄ oxidation at leaky wells**** | $0.02 \times 10^3 \pm ?$ | This study |
| Microbial CH₄ oxidation at blowout well 22/4b | $0.02-0.8 \times 10^3$ | Steinle et al. ⁴⁰ (considering that 1-3% of recent oceanic emissions of well 22/4b are oxidized) |
| CH₄ export to North Atlantic Ocean | 8×10^3 | Rehder et al. ³⁰ |
| Total CH₄ Budget | Total CH ₄ sources | Total CH ₄ sinks |
| kt yr ⁻¹ of CH ₄ | 7-46 | 18-60 |

**Assuming a gas flow of $5.7 \text{ L h}^{-1} \text{ seep}^{-1}$ at STP³¹ and 3 active seeps³⁴, the Scanner Pockmark field emits 0.1 t yr^{-1} of CH_4 (lower bound). Assuming a seabed gas flow of $1 \text{ m}^3 \text{ d}^{-1} \text{ seep}^{-1}$ ³⁴, a molar volume of CH_4 of 1.34 L mol^{-1} at 160 m water depth, and 3 active seeps³⁴, the Scanner Pockmark field emits $\sim 13 \text{ t yr}^{-1}$ of CH_4 (upper bound).*

*** Based on a seabed emission of $\sim 24 \text{ m}^3 \text{ d}^{-1}$ of CH_4 ^{31, 34} and assuming a molar volume of CH_4 of 2.69 L mol^{-1} at 75 water depth, the Norwegian Block 1/9 emits $\sim 52 \text{ t yr}^{-1}$ of CH_4 .*

**** We extrapolated the CH_4 export of the East Frisian back barrier area (125 t yr^{-1} of CH_4 per 197 km^2 ²⁸ on the entire back barrier tidal flat area from Den Helder to Esbjerg ($1188\text{-}3364 \text{ km}^2$)²⁸ assuming that the CH_4 concentrations and the water outflow of the Spiekeroog study area²⁸ are representative.*

***** We estimated the loss of CH_4 by methanotrophic communities at leaky wells, based on the maximum measured CH_4 oxidation rate of 1.4 nM d^{-1} (this study), a leakage area of $10 \text{ m}^2 \text{ well}^{-1}$ ²⁰, and an average leakage depth of 80 m (in accordance to the spatial distribution of wells and the North Sea bathymetry).*

2.2.6 Sources of uncertainty in our estimates. The range of uncertainty of shallow gas leakage in the North Sea is substantial, as might be expected from the current state of knowledge of leaky wells, mainly depending on the representativeness of data obtained in the Norwegian CNS. There is a large uncertainty in our estimates related to the unknown temporal and spatial variability of per-well leakage rates that might, in addition to sediment properties and tidal pressure fluctuations, be driven by overpressure in the shallow gas reservoir, or by differences in the gas supply. Further uncertainty is associated to the probability of wells to leak shallow gas. Assuming a binomial distribution from a Bernoulli process, the uncertainty in the frequency of leakage that a sample size of 55 wells would produce in the larger population of wells is believed to be small (i.e. $\pm 6\%$ 1- σ) compared to the uncertainty in the leakage rate per well. Our estimate for CH_4 leakage from hydrocarbon wells in the North Sea is based on the two lower leakage rates and the assumption that wells poking through shallow gas pockets will leak, which is corroborated by observed ebullition of biogenic gas at wells 15/9-13 and 16/7-2²⁰ as well as 15/9-11 and 15/9-16⁴³. Surveying for leaky wells and quantifying their ebullition rates (including longer time-series) is clearly needed in order to better constrain the North Sea CH_4 budget.

Atmospheric emission estimates bear further uncertainty arising from three additional factors: (1) temporal and spatial variability of the bubble chain dynamics (upwelling), (2) variability of initial

bubble sizes, and (3) seasonal/ inter-annual changes of seawater conditions. The latter may significantly affect the diffusive outgassing of CH₄ due to the seasonal deepening and breakdown of the thermocline^{30, 32,37,41} and the efficient ventilation of the entire water column during frequent fall and winter storms, which both should aid annual diffusive CH₄ emissions. No significant inter-annual variability is expected in the rate of direct CH₄ ebullition to the atmosphere because the bubble CH₄ transport is independent of the water column stratification and also nearly temperature-independent. This is because the increase in gas transfer velocity (K_L) compensates the decrease in gas solubility at elevated temperature. The approach to estimate atmospheric emissions is thus, believed to be conservative because the gas transport to the atmosphere might have been underestimated due to the seasonal increase in the ventilation of the water column or the evidence of upwelling flows at high-emitting seeps. Uncertainties related to initial bubble sizes remain, which might, in addition to spatial heterogeneities in the sediment properties, be driven by variations in the seabed gas flow, or bottom current intensity, or changes in the hydrostatic pressure³⁸.

2.2.7 Generality of our approach for assessing CH₄ emissions along wells in other regions that have undergone extensive offshore drilling. Shallow gas migration along hydrocarbon wells has not received much attention yet and data on leakage rates are limited to those observed at the three abandoned gas wells in the North Sea²⁰. Given the small sample size and unknown temporal and spatial variability of per-well leakage rates, the uncertainties behind annual, regional flux estimates are generally large (as discussed above). Due to regional differences in geology, the leakage rates (1-19 t yr⁻¹ of CH₄ per well)²⁰ and leakage frequency of wells (33 ± 6%) observed in the North Sea might not be appropriate for extrapolation to other regions that are rich in shallow gas and have undergone extensive offshore drilling. More measurements (including longer time series) are clearly needed to better constrain leakage rates and leakage pathways (i.e. gas migration along the well vs. well annulus leakage), both onshore and offshore.

Our numerical results to estimate atmospheric CH₄ emissions from submarine gas leaks indicate that wells (and seeps) located in water depths larger than 150 m generally do not contribute significant CH₄ to the atmosphere (see Figure S5, justified for initial bubble radii up to 4 mm), but rather contribute to CH₄ in the deep-water layer where it is transported by ocean currents and prone to microbial oxidation. Some unknown fraction of this deeply dissolved CH₄ may be mixed

into the surface mixed layer during storms and seasonal or inter-annual deepening and breakdown of the thermocline. The gas bubble dissolution rate is rather temperature-independent (see SI Section 2.2.6), suggesting that our numerical results (i.e. Supplementary Eq. 6, 9 and 10) are applicable for assessing approximate atmospheric CH₄ contributions in a variety of coastal (≤ 150 m water depth) marine and lacustrine regions (e.g. from the Gulf of Mexico to the Arctic). Supplementary Eq. 6 describes the transport efficiency of CH₄ bubbles to the sea surface with respect to the seabed CH₄ flow and as a function of the initial bubble size (justified for initial radii of 1-4 mm) and the leakage depth. Supplementary Eq. 9 and 10 describe the transport efficiency of CH₄ bubbles with a specific bubble size distribution (i.e. $r_e=2.6 \text{ mm}^{20}$, SI Figure S5) to the sea surface (Eq. S9) and to the SML (Eq. S10) with respect to the seabed CH₄ flow and as a function of the leakage depth, respectively. Their application is generally justified in marine regions up to 150 m water depth, where clean CH₄ bubbles, that initially contain only CH₄, rise in the absence of bubble plume dynamics (i.e. by the release of single bubble streams that do not induce upwelling). The general applicability of Eq. S10 to estimate the diffusive outgassing of CH₄ is limited due to regional differences in water column stratification and mixing (i.e. Eq. S10 considers the diffusive outgassing of CH₄ dissolved in the upper 50 m of the water column).

Our transfer functions (Eq. S6, S9, S10) are not suitable for assessing atmospheric CH₄ emissions in regions where gas bubbles are coated with oil, hydrates, and/or other surfactants, which generally prevent the gas exchange with ambient seawater and thus, favor the bubble-driven transport of seabed CH₄ to the surface. Further limitations are related to bubble plumes that generate upwelling, turbulences⁷¹, and/or spiral movement⁷², which affect the rate of bubble dissolution and have not been considered in our numerical simulations.

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